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Analysis of area-congestion-based DDoS attacks in ad hoc networks

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10 Abstract

11 Increased instances of distributed denial of service (DDoS) attacks on the Internet have raised questions on whether and 12 how ad hoc networks are vulnerable to such attacks. This paper studies the special properties of such attacks in ad hoc net-13 works. We examine two types of area-congestion-based DDoS attacks - remote and local attacks - and present in-depth 14 analysis on various factors and attack constraints that an attacker may use and face. We find that (1) there are two types 15 of congestion – self congestion and cross congestion – that need to be carefully monitored; (2) the normal traffic itself causes 16 significant packet loss in addition to the attack impacts in both remote and local attacks; (3) the number of flooding nodes 17 has major impacts on remote attacks while, the load of normal traffic and the position of flooding nodes are critical to local 18 attacks; and (4) given the same number of flooding nodes and attack loads, a remote DDoS attack can cause more damage 19 to the network than a local DDoS attack. 20 © 2006 Published by Elsevier B.V.

21 *Keywords:* Ad hoc network; Security; Congestion; Distributed denial of service; Denial of service 22

23 1. Introduction

24 DDoS attacks present a serious threat to network 25 computing and have recently attracted much atten-26 tion [1-6]. When a DDoS attack is launched, a large 27 number of hosts controlled by the attackers flood a 28 target with a high volume of packets to significantly 29 degrade the target's service performance or render it 30 unable to deliver any service. Ad hoc networks differ from the Internet in several critical ways that make 31

them especially vulnerable to DDoS attacks. First, 32 ad hoc nodes are peers. Because of this, once an 33 attacker compromises a node, they can attack the 34 network from inside. Second, every node in an ad 35 hoc network is not only a host but also a router. 36 Thus, it is harder to determine whether a suspicious 37 packet is from an attacker or relayed from a legiti-38 mate node. These features indicate that there may 39 be "easier" ways to cause denial of service (DoS) 40 in ad hoc networks than in the Internet, and that 41 existing Internet DDoS defense mechanisms may 42 not be enough to counter DDoS attacks in ad hoc 43 networks. 44

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45 Although congestion was recognized as a simple 46 and effective DoS attack approach in ad hoc net-47 works, previous studies mainly focused on individ-48 ual attackers and the attack impacts on individual 49 nodes and traffic flows. In an ad hoc network, it is 50 easy for attackers to attack simultaneously from dis-51 tributed locations; however, it is not clear how dam-52 aging the attacks can be and what are the unique 53 characteristics of the attacks. Due to the relative 54 newness of these concerns, more research on the 55 properties and methods of DDoS attacks in ad 56 hoc networks is needed.

57 Motivated by these observations, we explore the 58 possible DDoS attacks and their impacts on ad 59 hoc networks. In particular, we investigate how 60 attackers flood legitimate routes with junk packets. 61 Because wireless bandwidth is limited, the junk 62 packets can easily cause severe wireless channel con-63 tention among nearby nodes on the legitimate 64 routes. Therefore, the attack creates network-wide 65 congestion instead of congestion surrounding only 66 the destination as in conventional Internet DDoS 67 attacks. In this paper, we explore and discuss two 68 types of congestion - self and cross congestions -69 that may be caused by attacks. We analyze the 70 important factors that may affect the attacks. We 71 also review the existing defense mechanisms against 72 these DDoS attacks. This research lays the neces-73 sary foundation for developing more effective 74 defense strategies against DDoS attacks in ad hoc 75 networks.

76 2. Background

In this section, we present background informa-tion on DDoS and DoS attacks and review relatedworks.

80 2.1. DDoS attacks

81 In the Internet, attackers can launch a DDoS 82 attack from a huge number of hosts to conquer a 83 few target servers. Many attacking approaches have been identified. For example, attackers can send a 84 85 flood of SYN packets to block one of the server's TCP ports [7], flood the targets with misformed 86 87 ICMP echo packets [8], or bruteforcely flood them 88 with UDP packets [9]. Since most flooding packets 89 in DDoS attacks are sent out with spoofed source 90 addresses, much research on defense has focused 91 on identifying the true flooding sources, tracing back 92 to those sources, and filtering out the flooding pack-

93 ets. Aura et al. [10] proposed letting the server ask the client to respond to a cookie or solve a puzzle 94 when the client requests connection to the server. If 95 the client is spoofed, no reply will come from a 96 spoofed machine, or the real attacker will be over-97 98 whelmed by the server's response requests. Ferguson et al. [1] proposed the ingress filtering technology to 99 100 filter packets with a spoofed address outside the attacker's network. Mirkovic et al. [4] proposed D-101 WARD to set a rate limit for a suspicious flow that 102 does not match its normal model. With the help of 103 routers that embed trace information in a number 104 of normal packets, the victim can figure out the real 105 attack sources based on trace back [2,11]. Pi [5] lets 106 the victim identify the flooding source by putting 107 unique path identifiers in packets. Push back [3,12] 108 identifies attack aggregates in congested routers. 109 SAVE [13] requires routers to verify the source 110 address of incoming packets. In SIFF [6], routers 111 manipulate the marking fields in packets so that an 112 end-host can selectively stop individual flows from 113 reaching its network. A comprehensive overview 114 and classification of DDoS attacks and defense 115 approaches can be found in [14]. 116

A major characteristic of DDoS attacks in the 117 Internet is that the attacking sources are end hosts 118 that connect to the Internet from their access net-119 works and are remote to the victim. To take over 120 the target, the flooding packets travel through the 121 Internet from the flooding sources to the target. In 122 an ad hoc network, this kind of attack approach is 123 not the only choice for attackers. Since ad hoc nodes 124 are inside the network, the attackers are closer to 125 the target and can directly congest it. The attackers 126 can also redirect and forward traffic to the target 127 instead of generating junk packets by themselves. 128 In addition, because mobile nodes are no longer 129 the end hosts in an ad hoc network, attackers can 130 bypass the defending nodes. Hence, it is important 131 to clearly understand the possible new features of 132 such attacks and how DDoS attacks can be pre-133 vented in an ad hoc network. 134

2.2. DoS attacks in ad hoc networks 135

There are many approaches to launching DoS 136 attacks in an ad hoc network. In the physical layer, 137 jamming can be used to disrupt and suppress normal 138 transmission [15]. In the MAC layer, the attackers 139 can exploit defects of MAC protocol messages and 140 procedures. For instance, in the 802.11 MAC proto-141 col, the attackers can provide bogus duration infor-142

mation or misuse the carrier sense mechanism to 143 144 deceive normal nodes to avoid collision or keep 145 silent [16]. Gu et al. [17] analyzed how the attackers 146 can use certain packet generation and transmission behavior to obtain more bandwidth than legitimate 147 148 nodes so that legitimate transmission is suppressed. 149 Wullems et al. [18] identified a weakness in the cur-150 rent MAC protocol that enables an attacker to deceive other nodes and stop transmission. The 151 152 attackers can exploit the CCA function of the 153 802.11 PHY protocol to suppress other nodes with 154 the illusion of a busy channel. Borisov et al. [19] dis-155 covered several security flaws in WEP, which enables 156 an attacker to modify a message without being 157 detected and prevent users from obtaining correct 158 information from their service provider. Authors 159 from Refs. [20-23] have found that attackers can 160 break valid routes and connections by manipulating routing procedures and packets. Aad et al. [20] iden-161 162 tified the JellyFish attacks that drop, reorder or 163 delay TCP packets to disrupt TCP connections.

164 Differing from DDoS attack approaches in 165 the Internet, the aforementioned DoS attack approaches, except those that deal with routing or 166 higher layers, generally require an attacker to have 167 168 a specially designed network card in order to com-169 pose the attacking packets. For example, the 170 attacker needs to generate a strong signal in the 171 bandwidth for jamming, composing special MAC 172 packets for channel congestion, modifying for-173 warded routing packets to detour routes, or disor-174 dering TCP packets to break TCP connections. 175 Hence, these approaches are not very practical for 176 attackers trying to launch attacks from compro-177 mised nodes. In this paper, we study a simple attack 178 approach where attackers inject packets into legiti-179 mate routes. This approach only requires an attack-180 ing node to get valid routes from its routing tables 181 and impersonate a legitimate node.

3. Area-congestion-based DDoS attacks

Congestion has been recognized as a simple and 183 effective DoS attack approach in ad hoc networks. 184 In this section, we examine the special features 185 and concerns of area-congestion-based DDoS 186 attacks. 187

3.1. Attack topologies 188

We classify the DDoS attacks into remote attacks 189 190 and *local attacks*, according to attack topologies. Fig. 1 depicts the topologies and possible congestion 191 resulting from the DDoS attacks. The gray elliptical 192 area is an ad hoc network, where nodes a1, a2, 193 and a3 are the attackers, and nodes n1, n2, and n3194 are the legitimate nodes. The dashed lines stand 195 for the attack traffic through multiple hops, and 196 197 the solid lines for the attack traffic to nearby nodes. The shadowed areas are possible congested 198 199 areas.

The remote attacks in ad hoc networks are differ-200 ent from flooding in the Internet. In the Internet, a 201 congested link keeps its maximum throughput dur-202 ing each attack period. However, in ad hoc net-203 works, because the communication channel is 204 open and shared, packets in a small area can collide 205 with each other. Hence, different attack streams 206 interfere with each other when they go through 207 the same area. In addition, an attack stream may 208 experience self-congestion and the route may fre-209 quently change during the attack. As a consequence, 210 which routing nodes may forward the flooding 211 packets and how many flooding packets can reach 212 the target through multiple hops are largely unpre-213 dictable. Our simulations (described in detail later) 214 show that in a remote DDoS attack more flooding 215 nodes and higher attack load may in fact reduce 216 the attack impacts. 217



Fig. 1. Area-congestion-based attacks.

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218 Since local attackers are competing for the chan-219 nel with all other nearby nodes, local attackers may 220 suffer less self-congestion and be able to cause more 221 congestion to nearby targets. Our simulations show 222 that the impact of a local DDoS attack increases 223 with more flooding nodes and higher attack loads. 224 However, given the same number of flooding nodes 225 and attack loads, a remote DDoS attack can cause 226 more damage to the network than a local DDoS 227 attack.

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229 Similar to DDoS attacks in the Internet, area-230 congestion-based attacks need enough flooding 231 sources to significantly degrade the service perfor-232 mance. One approach for attackers in an ad hoc 233 network to obtain flooding nodes is to compromise 234 vulnerable mobile nodes or deploy mobile nodes in 235 different locations before the event. With enough 236 flooding nodes, compromised or deployed, the 237 attackers can command these nodes to flood the net-238 work at the appropriate time.

239 However, a flooding node may face other chal-240 lenges among which energy constraint is the most 241 critical one, especially when the flooding node is a 242 compromised mobile node. Since flooding consumes 243 power, a DDoS attack may not be economical if the 244 attack impact is not devastating. However, we find 245 that it does not require many flooding nodes or high 246 attack loads to cause serious damage. Furthermore, 247 the damage of a DDoS attack is mainly determined 248 by how the network is used and how users experi-249 ence the attack. In some critical situations, such as 250 in a battlefield, DDoS attackers may be willing to 251 trade energy to take over the ad hoc network even for only a short period. In addition, if the flooding 252 253 sources secretly tap into power sources, energy con-254 straints may not be an issue.

255 4. Remote attacks

256 In this section, we describe how an attacker can 257 inject packets into legitimate routes without being 258 detected. We also analyze the characteristics of 259 remote attacks, study their impacts, and review pos-260 sible defense methods.

261 4.1. Attack approaches

262 In a remote attack, the attackers send a flood of junk packets toward the service node over multiple 263

hops (see Fig. 1). When a routing node receives the 264 injected packets, it checks its routing table, finds 265 the routing entry according to the destination 266 addresses, and then forwards them. If the routing 267 node traces back according to the source address, 268 it may trace to the claimed source instead of the 269 flooding source, or find that the claimed source is 270 invalid. The reason why the attackers can still suc-271 272 ceed in flooding without being detected is that discrepancies exist between routing and forwarding. 273 For instance, even if secure routing protocols 274 275 [21,24] are enforced in ad hoc networks, no further 276 source verification is enforced in packet forwarding. Although the victim can identify the flooding 277 sources with some intrusion detection systems, he 278 may not be able to figure out where the packets come 279 280 from.

4.2. Attack constraints

There are two types of constraints – self and 282 cross congestion - often experienced by remote 283 attacks. 284

281

4.2.1. Self congestion

285 Because a routing node shares the channel with 286 other routing nodes in the same route, their trans-287 missions interfere with each other. If an attacker 288 injects packets very quickly, most packets will be 289 290 buffered in upstream nodes and dropped later due to link failures. Our simulations show that attackers 291 need to control the speed of packet generation to 292 achieve the maximum throughput. The generation 293 294 speed is measured by the generation gauge, which is the multiplication of the average period to generate 295 296 one bit and the total channel bandwidth. In our simulations, the channel bandwidth is set to 1 Mbps. If a 297 node generates attack load at 50 Kbps, i.e., it gener-298 ates one bit every 2 µs on average, its generation 299 gauge is 2. The quicker a node generates packets, 300 the smaller the generation gauge. 301

302 Fig. 2 shows the relation between the achieved throughput of UDP traffic and the generation gauge 303 in chain-like paths of different lengths. We depict the 304 curves for 5-hop, 10-hop and 20-hop paths. In the 305 figure, each curve has a peak. The slope at the right 306 side of the peak illustrates a normal situation which 307 has a slower packet generation, i.e., bigger genera-308 tion gauge, which results in less throughput. The 309 310 slope at the left side of the peak shows a special case which has faster packet generation and can reduce 311 the throughput. Obviously, the maximum through-312

^{3.2.} Attackers 228



Fig. 2. UDP throughput in a chain-like path.

313 put is achieved at the best generation gauge. Based314 on extensive simulations, we derive a heuristic rule315 as follows: For a single UDP path, the best genera-316 tion gauge is:



- around 15, if the length of the path is greaterthan 12 hops.
- 321

322 Due to self congestion, the longer a path is, the 323 less maximum throughput the UDP traffic has. As 324 illustrated in Fig. 2, if the path has 5 hops, the max-325 imum throughput is around 145 Kbps. If the path 326 has 10 hops, the maximum throughput is reduced 327 to 80 Kbps. If the path has 20 hops, the maximum 328 throughput is further reduced to 60 Kbps. Conse-329 quently, if one attacker is flooding a target from a 330 very long distance, the traffic that can actually reach 331 the target is less than 60 Kbps no matter how fast it 332 generates packets.

333 4.2.2. Cross congestion

334 Cross congestion is another constraint, where 335 different traffic flows interfere with each other. Con-336 sider Fig. 3 where all attackers send traffic toward 337 the target in the center. Assume that all flooding 338 sources are far away from each other, and able to 339 find the best routes which directly point to the tar-340 get. If the sensing distance is D_s and the average 341 angle between every two closest routes is θ , at least 342 one collision takes place at a location whose distance from the target satisfies $D \ge \frac{D_s}{2\sin^2}$. In other 343 words, at the distance *D* from the target, a maximum of $N_D = \frac{\pi}{\arcsin(D_s/2D)}$ flows can go through 344 345 346 toward the target without collision.

In the target's sensing range, at most 6 flows donot interfere with each other. If the flooding nodes



Fig. 3. Attack traffic collision.

are 3 hops away from the target, each node can 349 flood at 150-200 Kbps, and the total flooding traffic 350 351 toward the service node can consume a channel capacity of 1 Mbps. If the flooding nodes are far 352 away from the target, for example, more than 15 353 hops away, we need to consider the maximum 354 throughput of a single UDP flow discussed in Sec-355 tion 4.2.1. Assume that the attackers are smart 356 enough to select proper flooding topology so that 357 the flooding flows do not interfere with each other 358 before reaching the target. Sixteen flooding nodes 359 may be needed, since each of them can only get 360 50-70 Kbps of flooding traffic to reach the target. 361 In reality, however, because ad hoc routes are ran-362 dom, the attackers can hardly select such a topology 363 to avoid cross congestion. We use the simulations to 364 study the impact of the number of flooding nodes 365 on the target. 366

4.3. Simulations 367

NS2 [25] was used to model the simulations, 368 which was configured as follows: 369

Communication model. We use the default model 370 in NS2, i.e., the two-ray ground reflection model in 371 the physical layer, the IEEE 802.11 as the MAC and 372 PHY protocols for communications, a sensing 373 range of 550 m, a transmission range of 250 m, 374 and the channel capacity as 1 Mbps. For communi-375 cations over multiple hops, AODV is used as the 376 routing protocol. 377

Network topology. We simulate the attacks in a 378 4200 m \times 4200 m network. The network is divided 379 into 441 grids, each of which is a 200 m \times 200 m 380 square area. Inside each grid, a node is randomly 381 placed. Under these conditions, the network topology is randomly generated for each simulation. 383 We do not consider the movement of nodes in these 384

simulations, because the motion of nodes is much 385 386 slower than the dynamics of the network under attack. In an ad hoc network, the flooding nodes 387 388 may be randomly distributed in the network. This 389 is typically the case when some normal nodes are 390 compromised by the attackers for flooding. On the 391 other hand, attackers can intentionally deploy some 392 flooding nodes in a ring circling the service node. 393 For comparison, the ring is centered at the service 394 node and has a radius of 1300 m. The flooding 395 nodes are selected from the nodes on or close 396 (within 200 m) to the ring.

397 Traffic model. The node in the middle of the net-398 work is the service node, also referred to as the ser-399 ver in our discussion. In each simulation, we use 400 CBR agents to generate normal and flooding traffic. 401 In each simulation, we randomly select 10, 20, or 40 402 nodes as flooding nodes sending traffic toward the 403 service node. The flooding traffic starts 5 s after 404 the normal traffic, and continues for 30 s. The load 405 of a flooding flow is 20 Kbps, 50 Kbps, 100 Kbps, 406 or 200 Kbps. In each simulation, all flooding 407 streams have the same attack load. In an ad hoc net-408 work, the communication between two nodes may 409 still be congested by the flooding traffic toward the 410 service node. Hence, we study two patterns of normal traffic. One is the traffic that goes between the 411 412 service node and normal nodes. We randomly set 413 the direction of the traffic to or from the service 414 node. The other type of normal traffic is the traffic 415 between two randomly selected nodes.

416 Default traffic setting. We compare the attack 417 impacts under various traffic parameters and pat-418 terns. However, if it is not mentioned, the following 419 default traffic setting is applied. The normal traffic is 420 generated by 20 randomly selected normal nodes 421 and the service node. Ten normal nodes communi-422 cate with the service node, and the other 10 ran-423 domly communicate with other nodes. Eighty 424 percent of the normal traffic uses TCP connections, 425 and the remaining 20% uses UDP packets. All nor-426 mal traffic flows have a load of 20 Kbps. The flood-427 ing nodes are randomly put in the network. The flooding traffic uses UDP packets. 428

429 4.3.1. Experimental design

Five factors that may affect the attacks were considered in this study. We consider four attack loads
(20, 50, 100, and 200 Kbps), three numbers of flooding nodes (10, 20, and 40), two positions of flooding
nodes (random and ring), two loads of normal traffic (20 and 50 Kbps), and two patterns of normal

traffic (service and random). Hence, an experimental436design with 96 cells was used to represent the com-437binations of all the factors. For each cell, four inde-438pendent simulations were conducted. In total, there439were 384 data points for the experiment.440

We use the throughput loss of the normal traffic 441 to measure the attack impacts. The throughput loss 442 is defined as the percentage of the bits in all dropped 443 444 legitimate packets over the total bits in all legitimate packets during the attacks. The higher the through-445 put loss, the less the normal traffic can reach its des-446 447 tination and thus the more damage the attacks 448 cause. Each point of the throughput loss in the comparison figures is the average of the four indepen-449 dent simulations. Note that the throughput loss is 450 related to many factors in the application layer, 451 such as extra delay of the service due to retransmis-452 sion of the lost packets or disconnection from the 453 service node due to the loss of service request 454 packets. 455

4.3.2. Computational results 456

Table 1 presents the results of an analysis of var-457iance (ANOVA) for attack impacts. In an ANOVA458test, the factors have significant influence on the459measurements when the *P*-value is small (e.g., less460than 0.005). More explanations on *P*-value can be461

Table 1

ANOVA	analysis	of	remote	attacks
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Main effect	Mean square	DF	<i>F</i> -value	Significance
Load of flooding traffic (A)	0.00640	3	0.40	0.753
No. of flooding nodes (B)	0.08763	2	5.49	0.005
Position of flooding nodes (C)	0.00101	1	0.06	0.802
Load of normal traffic (D)	0.06379	1	4.00	0.048
Pattern of normal traffic (E)	0.23149	1	14.50	0.000
Two-way interaction				
A * B	0.01595	6	1.00	0.429
A * C	0.00802	3	0.50	0.681
A * D	0.03819	3	2.39	0.072
A * E	0.01996	3	1.25	0.295
B * C	0.01764	2	1.10	0.335
B * D	0.02733	2	1.71	0.185
B * E	0.18589	2	11.64	0.000
C * D	0.00034	1	0.02	0.884
C * E	0.00083	1	0.05	0.820
D * E	0.00812	1	0.46	0.497

* DF: degree of freedom; $\alpha = 0.05$.







462 found in [26]. Fig. 4 shows an overall evaluation of 463 the main effects of these factors. The results indicate 464 that, among these factors, the pattern of normal 465 traffic is significant at P < 0.001 and the number 466 of flooding nodes is significant at P < 0.005. Other 467 factors show only slight influence.

468 The results indicate that if all normal nodes com-469 municate with the service node, the damage from 470 the flooding attack will be amplified. This shows 471 that the normal traffic itself can cause packet loss 472 in addition to the damage caused by the flooding 473 traffic.

474 Also, we find that more flooding nodes leads to 475 less throughput loss. For instance, the throughput 476 loss drops from 77% for 10 flooding nodes to 69% for 40 flooding nodes. This indicates that cross con-477 478 gestion between flooding flows can significantly 479 reduce the effective volume of flooding packets in the network. In this way, the remote attack is differ-480 481 ent from a traditional DDoS attack. As such, if the 482 attacker uses 10 flooding nodes, he has a better 483 chance of causing congestion in the network than 484 if he uses 40 flooding nodes.

Although the results show that ring positioned
flooding nodes may cause slightly more damage than
randomly positioned flooding nodes, the impacts are

not statistically significant. A higher load of nor-488 mal traffic can cause higher throughput loss due to self congestion, but a higher load of flooding traffic slightly reduces the throughput loss. Consequently, in remote attacks, the most damage can be caused by a few flooding nodes with a low attack load.

Note that the difference in throughput loss under 495 496 various factors is relatively small compared to the average throughput loss. In general, the high end 497 of throughput loss is around 80%, while the low 498 end of throughput loss is around 70%. Hence, in a 499 remote attack, even if the attackers can control 500 many flooding resources, the actual attack impact 501 502 may not be greatly improved. In summary, in our simulations, 10 flooding nodes, each of them gener-503 ating attack traffic at 20 Kbps, can cause the most 504 damage on average. 505

4.3.3. Interactions among factors 506

We also evaluated the two-way interactions 507 among the five factors. All the interactions, except 508 the number of flooding nodes and the pattern of 509 normal traffic, are insignificant. 510

Fig. 5 shows the throughput loss of the two patterns of normal traffic, different numbers of flooding 512



Fig. 5. Normal traffic patterns: with the service node or between random nodes. In each figure, the solid lines stand for the throughput loss of normal traffic that connects with the service nodes, and the dashed lines for the traffic between two randomly selected nodes.

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nodes, and different attack loads. It is noted that 513 when normal nodes communicate with the server, 514 their traffic is more affected by the number of flood-515 516 ing nodes. When the number of flooding nodes is 517 small as in Fig. 5(a), the normal traffic connecting 518 with the service node can have more than 80%519 throughput loss. As the number of flooding nodes 520 grows, the throughput loss drops to 70% or even 521 less. In contrast, the throughput loss of random nor-522 mal traffic keeps a similar dropping pattern from 523 70% to 60%, no matter how many flooding nodes 524 are in the network. This comparison indicates that 525 the flooding traffic mainly affects the service node 526 when the number of the flooding nodes is small, 527 because the flooding traffic concentrates in the vicin-528 ity of the service node, whereas in the other areas, 529 the flooding traffic is not so intense. When the num-530 ber of flooding nodes is large, the network is full of flooding traffic and thus any kind of normal traffic 531 532 will be congested. In this situation, the throughput 533 loss of both types of normal traffic in Fig. 5(c) is 534 more similar than in others.

535 4.4. Defenses against remote attacks

536 Many defense approaches in the Internet have 537 limitations when applied in an ad hoc network 538 because they assume that: (a) attack hosts are end 539 systems, (b) routers are trusted, and (c) victims are 540 targets and vice versa. Unfortunately, all these 541 assumptions are not necessarily true in ad hoc net-542 works. Since attackers are inside an ad hoc network, 543 they can send spoofed packets but claim the packets 544 are forwarded. Routing nodes are not trustable 545 either. Some routing nodes can be the attacker's col-546 luders, and they can forward the flooding traffic. In 547 the Internet, the network access can be controlled at 548 the access point, such as by an ISP. However, in 549 order to block a suspicious flooding source and its 550 colluders in an ad hoc network, the routing nodes 551 need to verify and filter the junk packets. In addi-552 tion, an attack packet should be filtered as soon as 553 possible once it is in the network, since it always 554 has an impact on the area it goes through.

555 To prevent attackers from spoofing and flooding 556 packets in an ad hoc network, hop-by-hop source 557 authentication is needed so that every node partici-558 pates in the protection of the network. Normal 559 nodes can immediately detect and filter packets sent from malicious nodes. Yu et al. [27] proposed dis-560 561 tributing a credential to the routing nodes with the 562 routing packets when a route is set up. Then, only

563 the nodes in the route can verify the digital signature in the packets and only the source and the destina-564 tion nodes of the route can use this route. This 565 approach ensures that no one else can spoof the 566 source node inside or outside the route. However, 567 a route in an ad hoc network may frequently change, 568 which results in verification failures. Gu et al. [28] 569 proposed another hop-by-hop source authentication 570 approach to ensure that a packet can be verified 571 when a route is changed. In this approach, the rout-572 ing node at which a new route diverges from the old 573 574 route takes the responsibility of authenticating the 575 packets. The routing nodes in the new route can then verify the packets based on the new authentication 576 information. 577

5. Local attacks

In this section, we analyze the characteristics of 579 local attacks, study their impacts, and preview possible defense methods. 581

5.1. Attack approaches 582

In a local attack, the attackers send flooding traf-583 fic to their neighbor nodes to affect the traffic 584 through the neighbor nodes (see Fig. 1). One advan-585 tage of local attacks is that the flooding nodes do 586 not need to send the traffic over multiple hops. 587 Thus, the flooding nodes do not rely on other rout-588 ing nodes. Furthermore, the flooding nodes experi-589 ence less self congestion, since the flooding traffic 590 only goes through one hop. The flooding nodes also 591 have less cross congestion, especially when two 592 593 flooding nodes are far away from each other and cannot sense each other. The attack is effective only 594 if the normal traffic goes through the flooding area. 595 Greedy attackers may attack a lot of areas to make 596 the maximum impact on the whole network instead 597 of a single node. 598

599 One major problem of local attacks is that the 600 flooding node needs to compete for the channel with normal nodes. The flooding node can congest others 601 by composing large packets [29,30,17]. When a nor-602 mal node is suppressed by a flooding node and 603 unable to get sufficient bandwidth, it not only has 604 605 to defer the transmission of its packets, but also has limited time to accept packets from other nodes. 606 Other nodes may think the node is malfunctioning 607 608 and the link to this node may be conceived as a failure. This will trigger other nodes to break routes 609 going through this node or drop packets directed 610

611 to this node. We will use simulations to study the 612 complicated attack impacts.

613 5.2. Attack constraints

614 In a local attack, a flooding node only has a 615 direct impact on the area in its vicinity. Hence, a 616 local attack concerns how the flooding nodes may 617 be deployed and how serious the attack is. For analvsis purposes, we first observe the channel at a loca-618 619 tion x for a period of time T. During this period, it 620 takes $t_{tr}(x)$ for transmission in the channel. Of $t_{tr}(x)$, 621 $t_{norm}(x)$ is allocated for normal traffic. Then, define 622 normal traffic density at location x, $D_{\text{norm}}(x) =$, where S means the whole network. 623 $\int_{C} \frac{t_{tr}(x)}{\tau} dx$

624 The damage of a local attack can be measured 625 as $M = 1 - \int_{S} D_{\text{norm}}(x) dx$. Because $t_{\text{norm}}(x) \leq t_{\text{tr}}(x)$, 626 $\int_{S} D_{\text{norm}}(x) dx \leq 1$. If there is no attack, $t_{\text{norm}}(x) =$ 627 $t_{\rm tr}(x)$ and thus $\int_{S} D_{\rm norm}(x) dx = 1$ and M = 0, i.e., 628 damage is zero. If normal transmission is totally dis-629 abled, $t_{norm}(x) = 0$ and $t_{tr}(x)$ is for the attack traffic 630 only. In this case, $\int_{S} D_{\text{norm}}(x) dx = 0$ and M = 1, i.e., the network is 100% damaged. 631

632 It is very complicated to measure $t_{tr}(x)$ and 633 $t_{\text{norm}}(x)$ in an attack, because (a) routes are highly dynamic under attack due to link failure, (b) the 634 network traffic may be re-distributed due to route 635 636 changes, and (c) the effect of the attack traffic on 637 the normal traffic is determined by their interaction 638 and thus is uncertain due to the first two reasons. 639 However, it is possible to study some properties with simplified models. Assuming N compromised 640 641 nodes can disable their vicinities 100% once they 642 start an attack, then the damage (before the normal 643 traffic is re-distributed) is:

645
$$M = 1 - \int_{S} D_{\text{norm}}(x)(1 - d(x))dx,$$

646 where d(x) is a damage ratio, and $0 \le d(x) \le 1$. At 647 location x, d(x) = 1 if x is inside the attack area of 648 any attack host; otherwise, d(x) = 0, i.e., no damage 649 to this location. If the flooding nodes are randomly 650 distributed in the network, we can derive the average 651 damage as $E(M) = 1 - \int_S D_{\text{norm}}(x)(1 - E(d(x)))dx$. 652 When the normal traffic is uniformly distributed in 653 an ad hoc network, i.e., $D_{\text{norm}}(x) = \frac{1}{S}$ and the attack-654 ers can congest area s, it is not difficult to prove that 655 the damage is $M = \frac{s}{s}$, which indicates that the dam-656 age is proportional to the congested area in a network with uniformly distributed traffic. Hence, it 657 658 conforms to our common sense that an attacker

may want to deploy as many attack hosts as possible659and assign each attack host to a non-overlapped area660in a local attack.661

We use the same experiment as in Section 4.3, 663 except all flooding nodes only send packets to one 664 of its neighbors, to examine the characteristics of 665 the local attacks. All flooding nodes are randomly 666 selected from its neighbor nodes. 667

5.3.1. Computational results

Table 2 presents the results of an ANOVA for 669 attack impacts. Fig. 6 shows an overall evaluation 670 of the main effects. The results indicate that the pat-671 tern and load of normal traffic are significant at 672 P < 0.001, and the position of flooding nodes is sig-673 nificant at P < 0.05. These three factors can have 674 significant influence on the attack. The impacts of 675 other factors are not statistically significant. Note 676 that in both remote and local attacks, the impact 677 from the pattern of normal traffic is significant. This 678 indicates that an ad hoc network is vulnerable to all 679 kinds of traffic. If the network is full of normal traf-680 fic, the result will be similar to a DDoS attack. 681 From the viewpoint of the attackers, a good DDoS 682 attack strategy is to make use of the normal traffic. 683

Fable	2	

ANOVA	analysis	of	local	attacks
ANOVA	analysis	of	local	attacks

Main effect	Mean square	DF	F-value	Significance
Load of flooding traffic (A)	0.02299	3	1.34	0.269
No. of flooding nodes (B)	0.03921	2	2.29	0.110
Position of flooding nodes (C)	0.11108	1	6.48	0.013
Load of normal traffic (D)	0.80994	1	47.27	0.000
Pattern of normal traffic (E)	1.67708	1	97.87	0.000
Two-way interaction				
A * B	0.01847	6	1.08	0.385
A * C	0.01741	3	1.02	0.392
A * D	0.02985	3	1.74	0.168
A * E	0.13395	3	7.82	0.000
B * C	0.00403	2	0.24	0.791
B * D	0.01508	2	0.88	0.420
B * E	0.11877	2	6.93	0.002
C * D	0.00641	1	0.37	0.543
C * E	0.11989	1	7.00	0.010
D * E	0.01576	1	0.92	0.341

* DF: degree of freedom; $\alpha = 0.05$.

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Fig. 6. Attack impacts in local attacks under different factors.

684 The attackers only need to deploy the flooding 685 nodes in an area where normal traffic is not intense.

686 The load of normal traffic in a local attack is also 687 a main factor. This indicates that the ability of a 688 node to compete for the channel in a local attack 689 is an important factor that determines what portion 690 of the channel the node can obtain in a congestion 691 situation. In a remote attack, the importance of this 692 ability is reduced due to other problems in multi-693 hop transmission, such as exposed nodes and link 694 failure [31].

695 A local attack differs from a remote attack in that 696 the position of flooding nodes is one of the main fac-697 tors. In a remote attack, since flooding traffic goes through multiple hops, the positions of the flooding 698 699 nodes have less influence on where the traffic can go. 700 In a local attack, one hop flooding traffic can only 701 affect the nearby traffic. Hence, the attackers may 702 want to deploy the flooding nodes uniformly in the 703 network, if they can control the positions of the 704 flooding nodes.

Although other factors show little influence on the attack, they exhibit some properties different from in remote attacks. First, in local attacks, the attack impacts are increased with an increased number of flooding nodes. Since the flooding traffic in the local attacks suffers less from self and cross congestions, more flooding nodes obviously can cause more 711 damage to the network. Second, higher attack load 712 in local attacks can cause more damage to the net-713 work. In a local attack, the most damage is caused 714 when 40 flooding nodes are deployed in the network 715 and each node floods at the highest rate. Finally, on 716 average, the throughput loss in local attacks (0.55 \pm 717 0.23) is less than that in remote attacks (0.74 ± 0.15) . 718 Note that when the network is crowded with flood-719 ing nodes, the gap in throughput losses can be 720 reduced so that both types of attacks have similar 721 impacts. 722

5.3.2. Interactions among factors 723

Since the attack impact in a local attack is mainly 724 determined by how large an area is flooded by the 725 attackers, the interactions among factors are also 726 different from those in a remote attack. Our results 727 indicate that the pattern of normal traffic has interaction with the load of flooding traffic, the number of 729 flooding nodes, and the position of flooding nodes. 730

Fig. 7 shows that when normal nodes communicate with the service node, the flooding traffic has 732 only a slight influence on the attack impacts. The 733 average throughput loss of normal traffic is in a small 734 range around 60% under different numbers of flood-735 ing nodes and different attack loads. Since in this sit-736



Fig. 7. Normal traffic patterns: with the service node or between two random nodes. In each figure, the solid lines stand for the throughput loss of the normal traffic that connects with the service nodes, and the dashed lines for the traffic between two randomly selected nodes.

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vation, the normal traffic aggregates in the vicinity of
the service node, the normal traffic flows suffer from
cross congestion between themselves. The flooding
nodes only cause additional damage to the normal
traffic.

742 On the other hand, the random normal traffic has 743 less cross congestion, and is thus more affected by 744 the flooding traffic. Fig. 7(a) shows that the through-745 put loss of random normal traffic grows from 20% to 746 34% as the attack load increases. In Fig. 7(b) the 747 throughput loss grows from 22% to 42% and in 748 Fig. 7(c) the throughput loss grows from 20% to 749 61%. However, the throughput loss of random nor-750 mal traffic is generally less than that of the normal 751 traffic connecting with the service node. In the simu-752 lations, if the attack load is low, at 20 Kbps, the 753 throughput loss of random normal traffic is only 754 around 20%. The chance that the random normal 755 traffic is affected by the flooding traffic is also influ-756 enced by the number of flooding nodes. The high 757 end of the range of throughput loss of random nor-758 mal traffic grows as the number of flooding nodes increases, especially when the attack load is high. 759 760 at 200 Kbps. In Fig. 7(a), the high end of the range 761 of throughput loss of random normal traffic is only 762 34% while in Fig. 7(c), the high end of the range 763 reaches 61%.

764 5.4. Defense against local attacks

765 It is more difficult to prevent a malicious node 766 from sending flooding packets through one hop, 767 since no routing node is needed to forward junk 768 packets in a local attack. If the number of flooding 769 nodes is small, a routing node can redirect normal 770 traffic to circle around the congested area. Wood 771 et al. [32] proposed the JAM approach for letting 772 nodes detect and avoid a jammed area. The idea 773 can also be applied to protect normal traffic in a local 774 DDoS attack. Normal nodes can first detect the con-775 gested area according to the frequency of link fail-776 ure, the growing packet number in routing queues, 777 etc. If a congested area is detected, normal nodes 778 can forward packets to other nodes not in the con-779 gested area. However, the above approach is valid 780 only if the majority of the network is not congested. 781 When the number of flooding nodes is large, the 782 whole network may be under attack. Then it is hard 783 for a normal node to find another node not in a con-784 gested area.

Zhang et al. [33] proposed an intrusion detectionarchitecture, in which all nodes monitor transmis-

sions in their neighborhood and cooperate with their 787 neighbor nodes to exchange intrusion detection 788 789 information in order to detect the malicious node. Marti et al. [34] proposed using a watchdog to detect 790 791 the attacking nodes. Basically, a normal node eavesdrops on its next hop to check whether its next hop 792 forwards the packets that are received from the nor-793 794 mal node. After detecting malicious nodes, the nor-795 mal node uses a path rater to exclude the malicious node from its routes. In a clustered ad hoc network, 796 a cluster head is elected for monitoring data traffic 797 798 within the transmission range [35]. All of these intru-799 sion detection approaches require nodes to monitor 800 the transmissions in their neighboring areas. However, a malicious node may use a directional antenna 801 for transmission in order to avoid monitoring. 802 803 Also, a malicious node may ask other malicious nodes to circumvent its transmission area. Hence, 804 805 monitoring nearby transmissions may not be practical in this kind of adversary environment. Further-806 more, the detection relies on trusted neighboring 807 nodes. They assume that a trusted node will hon-808 estly report misbehavior. However, a malicious node 809 810 can ask another neighboring node to lie and deceive 811 defenders.

6. Conclusion

DDoS attacks are already a serious threat to the 813 Internet. In this paper, we show that DDoS attacks 814 are also a serious threat to ad hoc networks and are 815 more difficult to deal with in ad hoc networks. We 816 studied the attack impacts of two types of DDoS 817 818 attacks and compared important factors that influence the attacks. We find that a remote attack is a 819 more effective and efficient method for DDoS 820 attackers to damage the network. More flooding 821 nodes and higher attack load cannot increase, but 822 even reduce the attack impacts in a remote attack. 823 On the other hand, local attacks need more 824 825 resources than remote attacks. The damage in a local attack increases if more flooding nodes send 826 traffic at a higher attack load in the network. We 827 828 also find that the normal traffic has attack impacts on itself, and the DDoS attacks simply bring addi-829 tional damage to the network. 830

Although many approaches to defend against 831 DDoS attacks in the Internet have been developed, they cannot be directly applied to prevent 833 DoS attacks in ad hoc networks. Several defense 834 approaches against DoS attacks in ad hoc networks 835 have also been proposed, but the dynamic behavior 836

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- 837 of congestion and the complication of DoS attacks
- 838 in ad hoc networks deserve more investigation. This
- research explored the properties of area-congestion-839
- 840 based DDoS attacks, which lavs the necessary foun-
- 841 dation for developing more effective defense strate-
- 842 gies against DDoS attacks in ad hoc networks.

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